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## Genetically predicted circulating C-reactive protein concentration and colorectal cancer survival: A Mendelian randomization consortium study

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## Abstract

**Background:** A positive association between circulating C-reactive protein (CRP) and colorectal cancer (CRC) survival was reported in observational studies, which are susceptible to unmeasured confounding and reverse causality. We used a Mendelian randomization approach to evaluate the association between genetically-predicted CRP concentrations and CRC-specific survival.

**Methods:** We used individual-level data for 16,918 eligible CRC cases of European ancestry from 15 studies within the International Survival Analysis of Colorectal Cancer Consortium. We calculated a genetic risk score based on 52 CRP-associated genetic variants identified from genome-wide association studies. Due to the non-collapsibility of hazard ratios from Cox proportional hazards models, we used the additive hazards model to calculate hazard differences (HD) and 95% confidence intervals (CI) for the association between genetically-predicted CRP concentrations and CRC-specific survival, overall and by stage at diagnosis and tumor location. Analyses were adjusted for age at diagnosis, sex, body mass index, genotyping platform, study, and principal components.

**Results:** Of the 5,395 (32%) deaths accrued over up to 10 years of follow-up, 3,808 (23%) were due to CRC. Genetically-predicted CRP concentration was not associated with CRC-specific survival (HD= -1.15, 95% CI: -2.76 to 0.47 per 100,000 person-years,  $P=0.16$ ). Similarly, no associations were observed in subgroup analyses by stage at diagnosis or tumor location.

**Conclusions:** Despite adequate power to detect moderate associations, our results did not support a causal effect of circulating CRP concentrations on CRC-specific survival.

**Impact:** Future research evaluating genetically-determined levels of other circulating inflammatory biomarkers (i.e. interleukin-6) with CRC survival outcomes is needed.

## Keywords

C-reactive protein; genetic variants; colorectal cancer survival; Mendelian randomization

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## INTRODUCTION

Chronic inflammation plays an important role in colorectal cancer (CRC) development and progression.(1) Elevated level of inflammation after CRC diagnosis may lead to increased expression of proinflammatory mediators and promote tumor growth and progression.(2)

C-reactive protein (CRP) is an abundant acute-phase protein produced mainly by hepatocytes in response to pro-inflammatory cytokines.(3) Observational studies of CRC outcomes have reported positive associations between pre-diagnostic and pre-operative concentrations of CRP and larger tumor size, metastases, and survival.(4–8) These studies, however, may have been subject to bias as most were unadjusted or insufficiently adjusted for potential confounders and factors related to inflammation and survival, such as adiposity, use of non-steroidal anti-inflammatory drugs (NSAIDs), and smoking. Furthermore, disease progression itself could lead to enhanced tumor-associated inflammation and elevated concentrations of circulating pro-inflammatory markers. Thus, reverse causation is also a potential source of bias.

Most studies of CRP and CRC only had a single measurement of CRP, which may not represent lifelong levels of chronic inflammation. Mendelian randomization utilizes

inherited germline genetic markers known to be associated with the risk factor of interest, in this case circulating CRP concentrations. These genetic variants can serve as non-modifiable markers of long-term susceptibility to chronic inflammation. Because of the natural random assortment of alleles during gamete formation, genetic variants are not affected by environmental factors that occur after conception and are non-modifiable by disease progression.(9) Over the last of 15 years, genome-wide association studies (GWAS) have accumulated robust evidence on genetic variants associated with various inflammatory biomarkers, including CRP.(10,11) “Mendelian randomization” has become a common approach for observational studies of inflammatory biomarkers in association with cancer risk, providing a way to minimize reverse causality and residual confounding. However, Mendelian randomization studies of inflammatory biomarkers and cancer survival are scarce.(12)

In this study, we aimed to test the association of genetically predicted concentrations of CRP with CRC-specific survival using a Mendelian randomization approach. As a secondary aim, we evaluated stage- and tumor site-specific associations between genetically predicted circulating CRP concentration and CRC survival. To achieve this, we used the existing data on germline genetic variants and epidemiological and clinical factors from the International Survival Analysis in Colorectal Cancer Consortium (ISACC).

## MATERIALS AND METHODS

### Study sample

We included individuals diagnosed with incident, invasive CRC from ISACC, a consortium consisting of clinical trials, case-control, and cohort studies from North America, Europe, and Australia. Of the 26,282 eligible ISACC participants who had GWAS and survival data available (Figure 1), we excluded individuals whose GWAS data didn't pass QC (n= 1,154), whose epidemiologic data was not available (n=217), and those with non-European ancestry (n=1,200) for this analysis. Further exclusion of studies and individuals without data on CRC-specific survival outcome (n=6,793) resulted in a total of 16,918 subjects included in this analyses from the following fifteen studies: Colon Cancer Family Registry (CCFR) (13), Cancer Prevention Study-II (CPS-II) (14), German Darmkrebs: Chancen der Verhütung Durch Screening (DACHS) (15), Diet Activity and Lifestyle Study (DALIS) (16), Early Detection Research Network (EDRN) (17), European Prospective Investigation into Cancer (EPIC) (18), Health Professionals Follow-up Study (HPFS) (19), Melbourne Collaborative Cohort Study (MCCS) (20), Nurses' Health Study (NHS) (21), North Central Cancer Treatment Group (NCCTG) N9741 randomized trial ([ClinicalTrials.gov](https://clinicaltrials.gov/ct2/show/study/NCT00003594), Identifier: [NCT00003594](https://clinicaltrials.gov/ct2/show/study/NCT00003594)) (22), Physician's Health Study (PHS) (23), Prostate, Lung, Colorectal, and Ovarian Study (PLCO) (24), UK Biobank (UKB) (25), VITamins And Lifestyle Study (VITAL) (26), and Women's Health Initiative (WHI).(27) Study-specific details are summarized in Supplementary Table 1. All studies were approved by their respective Institutional Review Boards and participants provided written informed consent.

## Ascertainment of environmental variables and survival outcomes

Demographic and epidemiologic factors were collected using self- or interviewer-administered questionnaires at enrollment according to study-specific protocols. A multistep data harmonization process was conducted centrally to define epidemiologic and clinicopathological variables in the same way across studies, as described previously.(28) Information on cancer diagnosis, such as age at diagnosis, tumor location (proximal, distal colon, or rectum) and stage at diagnosis (local: American Joint Committee of Cancer [AJCC] stage I; regional: AJCC stage II/III; or distant: AJCC stage IV), was obtained from cancer registries and/or medical records.

All study participants were followed for vital status. Date and cause of death were ascertained through linkages to the National Death Index or cancer registries (CCFR, CPSII, DACHS, DAL5, EPIC, MCCS, UKB, VITAL) or via active follow-up with dates/cause of death verified by the review of death certificates and/or medical records (HPFS, NHS, PHS, PLCO, WHI, N9741). Time to event was defined as days between CRC diagnosis and death, last date of contact, or the end of study follow-up. To evaluate 10-year CRC-specific survival, we censored cases at 10 years from the date of CRC diagnosis. Cases who died from causes other than CRC within 10 years from diagnosis were censored at the time of death. We used the International Classification of Diseases-9 (ICD-9) or ICD-10 (depending on year of linkage) to define CRC-specific deaths (ICD-9: 153.0–153.4, 153.6–153.9, or 154.0–154.1; ICD-10: C18.0–20.0 or C26.0).

## Genotyping, quality control (QC), and imputation

Details of genotyping and QC methods have been reported previously.(29–33) Briefly, genomic DNA was extracted from blood or buccal samples using conventional methods. Genotyping was performed using multiple platforms (Supplementary Table 1). All genotype data underwent standardized QC procedures including the exclusion of samples and SNPs with low call rates (<98%), chromosomal anomalies, samples with discrepancies in self-reported and genetically-determined sex, and SNPs out of Hardy–Weinberg Equilibrium. To investigate population structure, we used Plink (v1.9) to conduct principal components analysis (PCA). We restricted our analytic sample to participants with estimated European ancestry based on the PCA due to the low numbers of participants of other ancestries (detailed in Supplementary Methods). We imputed genotypes to infer unobserved genotypes and increase the density of genetic variants. All samples were first phased using SHAPEIT2 (34) and imputed to the Haplotype Reference Consortium (HRC) panel (35) using the University of Michigan Imputation Server.(36)

## Selection of instrumental variables

The Cohorts for Heart and Aging Research in Genomic Epidemiology (CHARGE) is the largest GWAS of circulating CRP concentrations to date, analyzing 204,402 individuals of European descent.(11) It reported 48 lead genetic variants from the HapMap GWAS and four additional variants from the 1000 Genome GWAS that were associated with CRP at the genome-wide statistical significance ( $P < 5 \times 10^{-8}$ ). Together these 52 SNPs explained 6.5% of the variance in circulating CRP.(11)

We also searched for, but did not identify additional variants from the NHGRI-EBI GWAS Catalog (37) (downloaded on 03/09/20) that met the following criteria: 1) association with CRP at a genome-wide statistical significance level ( $P < 5 \times 10^{-8}$ ); 2) study population of European ancestry; 3) not in LD ( $R^2 < 0.3$ ) with previously selected SNPs; and 4) available information on effect sizes and standard errors.

We included the 52 variants as instrumental variables in our Mendelian randomization analyses. The imputation quality ( $r^2$ ) of all 52 CRP-associated SNPs in our data was greater than 0.8. We then calculated a 52-SNP genetic risk score (GRS) (38) by taking the sum of the number of risk (CRP-increasing) alleles for each of the 52 genetic variants weighted by the  $\beta$  coefficients reported by the CHARGE study.(11) The  $\beta$  coefficients represent the change in the natural-log-transformed CRP per copy increment in the risk allele (Table 1).

### Statistical Analysis

The genetic variants selected as an instrumental variable in a Mendelian randomization analysis need to meet three assumptions: (1) they are robustly associated with the exposure (“relevance”), (2) they do not share a common cause with the outcome (“exchangeability”), and (3) they affect the outcome only through the exposure (“exclusion restriction”).

We first verified the “relevance” assumption by evaluating the association between GRS and post-diagnosis circulating CRP concentrations in a subset of CRC cases from Seattle CCRF (n=285) whose CRP levels were measured in between one to three years after diagnosis to rule out active treatment effects.(39) We estimated the proportion of variance ( $R^2$ ) explained by the 52 genetic variants and calculated the F statistic, a measure of instrument strength, based on  $R^2$ , the sample size (n), and the number of instruments (k) as described in the formula:  $F = \frac{R^2}{R^2 + 1} * \frac{n-k-1}{k}$ . A strong instrumental variable is defined as having  $F > 10$ .(40)

For the second “exchangeability” assumption, we examined several epidemiologic and clinicopathological factors that may confound the CRP- survival association, including smoking, body mass index (BMI), NSAID use, tumor location, and stage at diagnosis. Each was assessed for association with the GRS. BMI was statistically significantly associated with the GRS and therefore it was included as an additional adjustment variable in the following Mendelian randomization analysis. No other variables were statistically significantly associated with GRS.

The “exclusion restriction” assumption was assessed in a series of sensitivity analyses. We used MR- Egger regression to assess the horizontal pleiotropic effect. The test of a non-zero intercept indicates whether there are averaged pleiotropic effects.(41) We also restricted the instrumental variable to rs2794520 in the *CRP* gene to minimize the probability of horizontal pleiotropy. This variant itself explained 1.4% of the variance in circulating CRP. (11)

We performed the Mendelian randomization analyses using a two-stage regression approach. (42) Additive hazards model offers a flexible alternative for modeling associations on the hazard scale: a hazard difference (HD), unlike the hazard ratio (HR) from the Cox

proportional hazards model, is a collapsible effect measure over strata of unmeasured and unknown confounders. (42,43) We used additive hazards models to calculate HD and 95% confidence intervals (CI) for the associations between CRP-associated GRS and CRC-specific survival. The R package “timereg” was used for fitting additive hazards models.(44)

We also evaluated the association between genetically determined CRP circulating concentration and CRC-specific survival using the inverse-variance weighted (IVW) method (45), MR-Egger regression (41), and the estimator from the weighted median approach (46) based on summary statistics on SNP-specific associations with CRC survival. In secondary analyses, we evaluated the associations between genetically predicted concentrations of CRP and CRC-specific survival according to tumor stage and location.

In the sensitivity analyses, Cox proportional hazards models were used for hypothesis testing. We also compared results with and without adjustment of BMI in addition to age at diagnosis, sex, genotyping platform, study, and the first nine principal components. All analyses were conducted using R version 3.6.0.

### Statistical power

Currently, there is no available power calculation tool for survival outcomes in Mendelian randomization analysis, we first took a conservative approach treating CRC-specific survival as a binary outcome and used the methods described by Burgess. (47) With a total of 16,916 CRC cases and 23% CRC-specific deaths occurring over up to 10 years follow-up, we have more than 85% power to detect an OR of 1.25 for the association between CRP and CRC-specific survival at a significance level of 0.05, assuming 5.9% variance of CRP explained by the genetic variance.

In addition, we ran a simulation using the additive hazards model for power calculation. With the number of CRC cases and 3,808 CRC deaths accrued over a 10-year follow-up, the population-averaged hazard was estimated to be  $3808/(16918*10) = 0.023$  per person\*year. We have at least 83% power to detect a 25% difference in hazard ( $HD=0.0058$ ) for every 1 SD increase of CRP assuming 5.9% of the variance of CRP was explained by GRS. The R code for the simulation is included in the Supplementary Materials.

## RESULTS

We included 16,918 eligible CRC cases from ISACC in this study (Figure 1). Study participants were diagnosed at a median of 67 years of age, and 49.7% were female. Over the maximum 10-year follow up, there were 5,395 (32%) deaths accrued with 3,808 (23%) due to CRC. Study-specific summaries are shown in Supplementary Table 1. SNP-specific associations with circulating CRP concentrations and CRC-specific survival are summarized in Table 1.

In evaluating the “relevance” assumption, we observed strong associations between the GRS and circulating CRP concentrations in a subset of the study participants ( $n= 285$ ). A one-unit increase in GRS was associated with a 1.22-unit increase in the natural-log-transformed CRP (95% CI: 0.65–1.80,  $P= 4.33 \times 10^{-5}$ ) and explained 5.9% of the variance of the natural-

log-transformed CRP concentrations. The estimated F statistic was 20.2, indicating a strong instrumental variable.

Among the 16,918 participants from ISACC, the distribution of the CRP-associated GRS calculated based on individual-level data is shown in Supplementary Figure 2. Based on additive hazards model, we observed that one unit increase in GRS was associated with 1.15 fewer deaths due to CRC per 100,000 patients each year (HD= -1.15, 95% CI: -2.76 to 0.47 per 100,000 person-year, Table 2). However, it didn't reach statistical significance ( $P= 0.16$ ). No associations between quartiles of GRS and CRC-specific survival were observed (Table 2). Results based on IVW, MR-Egger, and weighted median approaches using summary statistics were consistent with those based on individual GRS data (Table 2). Sensitivity analyses using Cox proportional hazards models for hypothesis testing showed similar null associations between GRS and CRC-specific survival (HR= 0.90, 95% CI= 0.79 to 1.02,  $P= 0.10$ , Table 2).

We further evaluated this association by stage at diagnosis and tumor location, and found no evidence of statistically significant association in these subgroup analyses using Cox proportional hazards models, whereas the additive hazards model did not converge due to limited number of events in subgroups. (Table 3). Among individuals diagnosed with colon cancer, we observed a borderline significant association: one unit increase in GRS was associated with improved CRC-specific survival (HR=0.87, 95% CI: 0.75 to 1.00,  $P= 0.06$ , Table 3).

We plotted the SNP-specific associations with CRC-specific survival against coefficients of SNP-CRP associations (Figure 2). After conducting MR-Egger regression analysis, we found that the intercept was not statistically significantly different from zero ( $\beta_0 = 1.28 \times 10^{-7}$ , 95% CI =  $-1.23 \times 10^{-6}$  to  $1.48 \times 10^{-6}$ ,  $P= 0.85$ ) when using additive hazards models. This suggested no horizontal pleiotropic effect. The MR-Egger regression using Cox proportional hazards estimates (Figure 2B) yielded similar results compared to the one using additive hazards models (Figure 2A). We then restricted the instrumental variable to rs2794520 in the *CRP* gene and repeated the Mendelian randomization analysis. A null association with CRC survival was observed (additive hazards model: HD= -0.049 per 100,000 person-year,  $P= 0.88$ ; Cox proportional hazards model: HR= 0.99, 95% CI: 0.94–1.04,  $P=0.60$ ).

## DISCUSSION

In this large Mendelian randomization study, we did not find evidence of an association between genetically predicted CRP circulating concentration and CRC-specific survival in a cohort of individuals diagnosed with incident invasive CRC and followed up for survival. No associations were observed in subgroups defined by tumor stage at diagnosis and location. Our findings do not support a causal relationship between circulating CRP and CRC-specific survival.

Previous studies of CRP and CRC incidence and survival do not provide convincing evidence of causation. For CRC risk, meta-analyses of prediagnostic circulating CRP



concentrations showed that one unit change in natural logarithm CRP was associated with a 12% increased risk of developing CRC.(48) Conversely, we showed in a large multi-consortium Mendelian randomization study with more than 30,400 cases and 22,800 controls no association between genetically determined CRP concentrations and CRC risk. (49) For CRC-specific survival, results from observational studies of circulating CRP concentration were inconsistent. Some studies observed that circulating CRP concentration measured before surgery was not statistically significantly associated with survival after multivariable adjustment.(7,8) Other studies observed that elevated concentrations of pre-operative (4–6,50) and post-treatment (51,52) CRP were associated with worse CRC survival outcomes. However, the CRP measures in these studies were crude. Several of these studies used CRP  $\geq 10$ mg/L as the cut-off to dichotomize circulating CRP concentrations. (4,5,50) Elevated CRP concentrations  $\geq 10$ mg/L are likely driven by acute inflammatory conditions other than chronic inflammation. Similarly, in our recent study, circulating concentration of CRP was no longer associated with CRC survival after we excluded CRC cases who had post-treatment CRP $>10$ mg/L.(39)

In this study, we used genetic variants as proxies of circulating CRP concentrations that can help address potential biases due to residual confounding and reverse causality, but existing evidence on CRC survival outcomes is limited. Slattery et al. evaluated four tag SNPs in the *CRP* gene in relation to CRC survival among 1,574 cases, however, none were statistically significantly associated with CRC-specific survival within 5 years after diagnosis.(53) Another study with 421 CRC cases of East Asian ancestry showed that two SNPs from the *CRP* gene were associated with CRC survival: rs3093059 was associated with disease-free survival, whereas rs1205 was associated with CRC-specific survival.(54) Although these two variants were not included in our study, we evaluated rs2794520, at *CRP* locus that is in high LD with these two SNPs. The allele frequencies of these SNPs are twice as common in the East Asian population (ASN) compared with the European population (EUR): rs3093059 (ASN: 0.14; EUR: 0.07), rs2794520 and rs1205 (ASN: 0.60; EUR: 0.31). This could partially explain the different study findings.

There are some limitations when interpreting our study results. First, the restriction of our study sample to individuals diagnosed with CRC by design could be a potential source of selection bias (also known as collider bias) particularly if CRP is causally associated with increased risk of developing CRC. By conditioning on the collider- CRC risk (selecting only CRC cases into the study sample), it can induce an association between genetic variants and risk factors of CRC. However, evidence from our previous Mendelian randomization study suggests that CRP is not causally associated with CRC risk.(49) To further address this potential selection bias, we evaluated the associations between the genetic variants with both potential confounders of CRP and CRC survival associations and common risk factors of CRC risk. BMI was identified as the only variable being statistically significantly associated with the GRS for CRP in our study sample and was adjusted for in all analyses. However, as BMI is an inheritable trait that shares some genetic susceptibilities with CRP, we also assessed whether there was potential bias due to BMI adjustment (55,56) and compared main analysis with and without adjustment of BMI (Supplementary Table 2). We observed minimal changes due to BMI adjustment. Second, the 52-SNP GRS for CRP explained only less than 6% of the variance of the natural-log-transformed CRP concentrations. The null

results of our study cannot rule out a weaker causal effect of CRP on CRC-specific survival. Third, the genetic variants shown to be robustly associated with circulating CRP were identified from a GWAS based on study sample from the general population. The SNP-CRP associations may be different in a sample of CRC cases. Although we evaluated the “relevance” assumption in a subset of our study sample and observed a strong association between the CRP-associated GRS and post-diagnostic circulating CRP concentrations among CRC cases, the small sample size limited the statistical power to evaluate SNP-specific associations with CRP among CRC cases. In addition, our subgroup analyses had insufficient statistical power even though our main analysis was well powered. The limited number of events in subgroups also led to convergence issues when using the additive hazards model. Lastly, since the study sample was limited to individuals with European ancestry, our findings may not be generalizable to other racial/ethnicity groups.

Our study also has many strengths. This is the first study that evaluates circulating biomarkers in relation to CRC survival using a Mendelian randomization approach. Our large sample size possessed adequate statistical power to detect associations with moderate effect sizes. Also, the well-characterized study sample with individual-level genotype data and detailed information on epidemiologic and clinic factors allowed us to compare study results with those based on summary statistics, to evaluate the “exchangeability” assumptions, and to conduct subgroup analysis by stage at diagnosis and tumor location, however we weren’t able to account for several clinical prognostic factors for CRC survival, such as treatment, due to data availability. A subset of study participants had data on both genotypes and circulating CRP concentrations allowing us to evaluate the “relevance” assumption. By carefully examining the three assumptions, our Mendelian randomization study is less susceptible to confounding and reverse causality compared with observational studies.

In summary, our study did not find evidence of an association between genetically predicted circulating CRP concentration and CRC-specific survival, overall or in subgroups defined by stage at diagnosis or tumor location. Future research should be conducted to determine if other circulating inflammatory biomarkers, such as interleukin 6, are associated with CRC survival outcomes to better understand chronic inflammation and disease progression among CRC patients.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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#### Conflicts of Interest:

The authors have no conflicts of interest to disclose, except that: *Dr. Goldberg* reports consulting/advisory role for Merck, Taiho Pharmaceutical, Merck KGaA, and Novartis, research funding from Bristol-Myers Squibb, and meeting travel reimbursement from Merck and Merck KGaA. *Dr. Shi* reports consulting/advisory role for Yiviva Inc and Boehringer Ingelheim Pharmaceuticals, Inc (to self), stock from Johnson & Johnson, Amgen, and Merck & CO. (to self), research funds from Celgene/ Bristol-Myers Squibb and Roche/Genentech (to institution).

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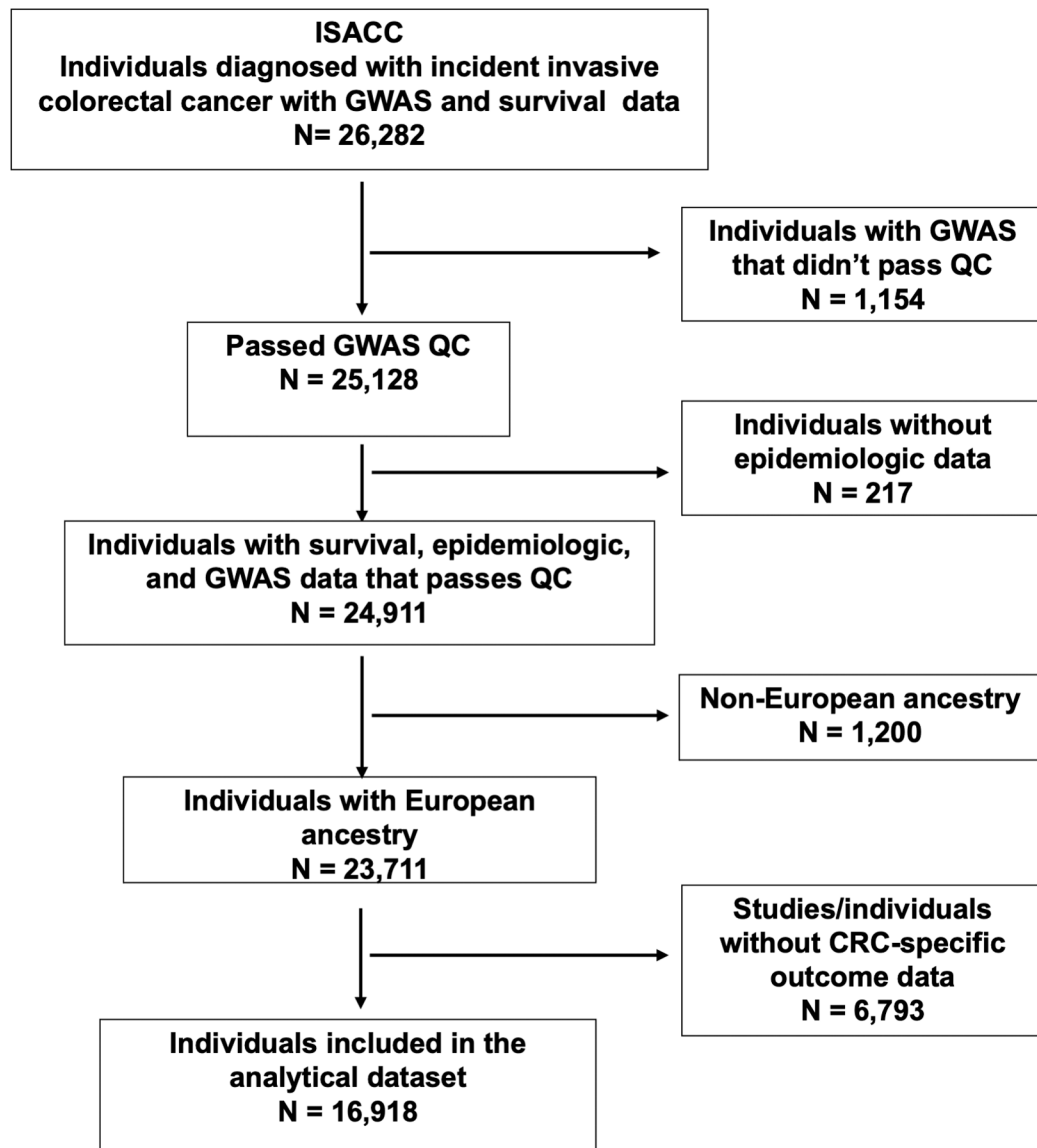
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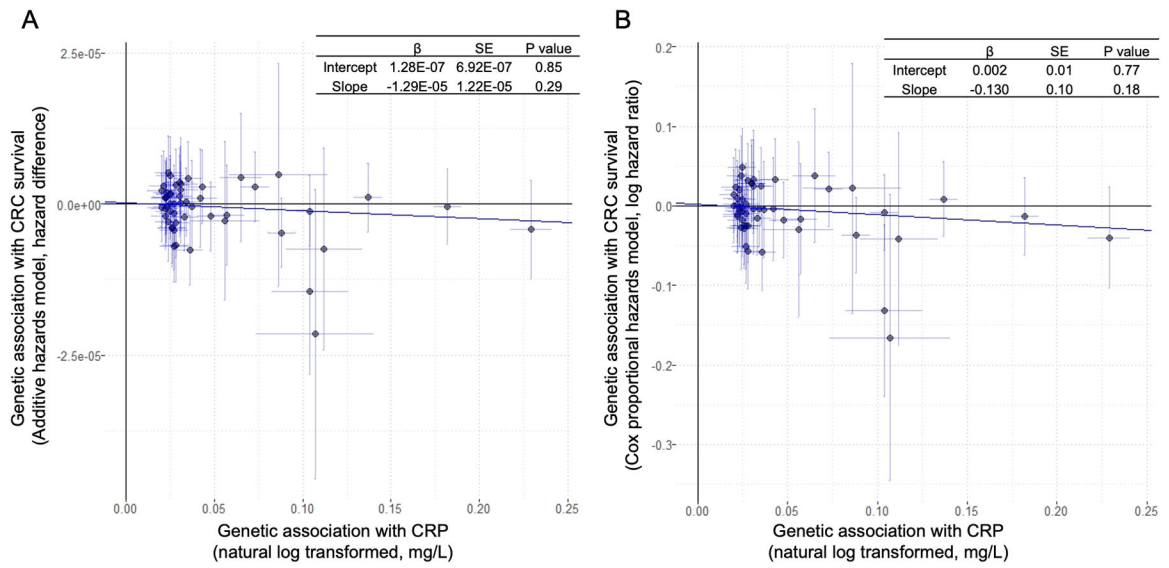
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**Figure 1.**

Study sample diagram. Of the 26,282 eligible ISACC participants with both GWAS and survival data, we further excluded individuals based on GWAS QC, genetic ancestry, availability of epidemiologic data and disease-specific survival outcomes, leaving a total of 16,918 subjects included in the analysis.



**Figure 2.** Scatter plot of SNP-specific associations with CRC survival against coefficients of SNP-CRP associations among CRC cases from ISACC using A) additive hazards models and B) Cox proportional hazards models. The slope of the regression line provides an estimate of the association between genetically predicted circulating concentration of CRP and CRC survival; the intercept is an estimate of the average pleiotropic effect across all the genetic variants.

**Table 1.**

Association between 52 SNPs and circulating CRP concentrations identified in Ligthart et al. (11) and between SNPs-and CRC-specific survival associations in ISACC

rs	chr: pos*	Count/ Alternative allele	Count allele freq	Ligthart et al. SNP-CRP associations			ISACC SNP-survival associations		
				beta**	se	P	HD*** (per 100,000 person year)	se	P
rs2293476	1:40036847	C/G	0.23	0.030	0.004	8.27E-13	0.124	3.44E-06	0.72
rs1805096	1:66102257	G/A	0.62	0.104	0.004	2.17E-183	-0.121	2.99E-06	0.68
rs4129267	1:154426264	C/T	0.61	0.088	0.004	1.20E-129	-0.474	2.91E-06	0.10
rs2794520	1:159678816	C/T	0.66	0.182	0.004	4.17E-523	-0.049	3.17E-06	0.88
rs10925027	1:247612562	T/C	0.40	0.036	0.004	4.25E-21	-0.759	2.92E-06	0.01
rs1260326	2:27730940	T/C	0.41	0.073	0.004	2.72E-92	0.278	2.95E-06	0.35
rs13409371	2:113838145	A/G	0.39	0.048	0.004	5.07E-36	-0.209	2.91E-06	0.47
rs13233571	7:72971231	C/T	0.88	0.057	0.005	2.95E-25	-0.180	4.22E-06	0.67
rs4841132	8:9183596	G/A	0.92	0.065	0.006	2.00E-25	0.442	5.40E-06	0.41
rs10778215	12:103537266	T/A	0.52	0.033	0.004	1.86E-20	-0.222	2.87E-06	0.44
rs7310409	12:121424861	G/A	0.60	0.137	0.004	2.54E-299	0.105	2.88E-06	0.71
rs340005	15:60878030	A/G	0.63	0.030	0.004	1.01E-15	0.352	2.92E-06	0.23
rs10521222	16:51158710	C/T	0.95	0.104	0.011	2.06E-22	-1.450	6.99E-06	0.04
rs2852151	18:12841176	A/G	0.40	0.025	0.004	1.36E-11	-0.002	2.94E-06	0.99
rs4420638	19:45422946	A/G	0.83	0.229	0.006	1.23E-305	-0.425	4.16E-06	0.31
rs1800961	20:43042364	C/T	0.97	0.112	0.011	4.63E-23	-0.742	8.51E-06	0.38
rs469772	1:91530305	C/T	0.81	0.031	0.005	5.54E-12	0.242	3.60E-06	0.50
rs12995480	2:629881	C/T	0.83	0.031	0.005	1.24E-10	0.329	3.92E-06	0.40
rs4246598	2:88438050	A/C	0.46	0.022	0.004	5.11E-10	-0.200	2.89E-06	0.49
rs9284725	2:102744854	C/A	0.24	0.027	0.004	7.34E-11	-0.434	3.36E-06	0.20
rs1441169	2:214033530	A/G	0.47	0.025	0.004	2.27E-11	-0.130	2.81E-06	0.64
rs2352975	3:49891885	C/T	0.31	0.025	0.004	6.43E-10	0.161	3.27E-06	0.62
rs17658229	5:172191052	C/T	0.04	0.056	0.010	5.50E-09	-0.274	6.67E-06	0.68
rs9271608	6:32591588	G/A	0.17	0.042	0.005	2.33E-17	0.094	4.15E-06	0.82
rs12202641	6:116314634	C/T	0.60	0.023	0.004	3.00E-10	0.187	2.94E-06	0.53
rs1490384	6:126851160	C/T	0.49	0.025	0.004	2.65E-12	0.175	2.83E-06	0.54
rs9385532	6:130371227	C/T	0.66	0.026	0.004	1.90E-11	-0.403	3.25E-06	0.21
rs1880241	7:22759469	A/G	0.51	0.028	0.004	8.41E-14	-0.313	2.90E-06	0.28
rs2710804	7:36084529	C/T	0.37	0.021	0.004	1.30E-08	0.298	2.91E-06	0.31
rs2064009	8:117007850	T/C	0.58	0.027	0.004	2.28E-14	-0.697	3.03E-06	0.02
rs2891677	8:126344208	T/C	0.54	0.020	0.004	1.59E-08	0.212	3.00E-06	0.48
rs643434	9:136142355	A/G	0.37	0.023	0.004	1.02E-09	-0.041	3.05E-06	0.89
rs1051338	10:91007360	G/T	0.30	0.024	0.004	2.27E-09	0.514	3.14E-06	0.10
rs10832027	11:13357183	A/G	0.67	0.026	0.004	4.43E-12	-0.394	2.96E-06	0.18

rs	chr: pos*	Count/ Alternative allele	Count allele freq	Ligthart et al. SNP-CRP associations			ISACC SNP-survival associations		
				beta**	se	P	HD*** (per 100,000 person year)	se	P
rs10838687	11:47312892	T/G	0.79	0.031	0.004	9.12E-13	0.016	3.39E-06	0.96
rs1582763	11:60021948	G/A	0.63	0.022	0.004	2.37E-09	-0.083	2.97E-06	0.78
rs7121935	11:72496148	G/A	0.62	0.022	0.004	5.28E-09	0.090	3.04E-06	0.77
rs11108056	12:95855385	C/G	0.58	0.028	0.004	5.42E-14	0.318	3.02E-06	0.29
rs2239222	14:73011885	G/A	0.37	0.035	0.004	9.87E-20	0.415	3.15E-06	0.19
rs4774590	15:51745277	G/A	0.62	0.022	0.004	2.71E-08	0.110	3.07E-06	0.72
rs1558902	16:53803574	A/T	0.40	0.034	0.004	5.20E-20	0.030	2.84E-06	0.92
rs178810	17:16097430	T/C	0.56	0.020	0.004	2.95E-08	-0.060	2.83E-06	0.83
rs10512597	17:72699833	C/T	0.80	0.037	0.005	4.44E-14	-0.048	3.87E-06	0.90
rs4092465	18:55080437	G/A	0.62	0.027	0.004	3.11E-10	-0.154	3.11E-06	0.62
rs12960928	18:57897803	C/T	0.26	0.024	0.004	1.91E-09	-0.296	3.34E-06	0.38
rs2315008	20:62343956	G/T	0.68	0.023	0.004	5.36E-10	0.118	3.11E-06	0.70
rs2836878	21:40465534	G/A	0.73	0.043	0.004	7.71E-26	0.289	3.10E-06	0.35
rs6001193	22:39074737	A/G	0.63	0.028	0.004	6.53E-14	-0.678	3.10E-06	0.03
rs75460349	1:27180088	A/C	0.98	0.086	0.014	4.50E-10	0.477	9.43E-06	0.61
rs1514895	3:170705693	G/A	0.30	0.027	0.004	2.70E-09	0.002	3.26E-06	0.99
rs112635299	14:94838142	G/T	0.98	0.107	0.017	2.10E-10	-2.150	1.22E-05	0.08
rs1189402	15:53728154	A/G	0.63	0.025	0.004	3.90E-09	0.474	3.20E-06	0.14

\*Chromosome: position, hg19

\*\*beta, SNP-specific coefficients for association with circulating concentrations of CRP obtained from Ligthart et al, per unit increase in natural log transformed CRP (mg/L)

\*\*\*hazards difference for CRC-specific survival per unit increase in the count allele based on additive hazards model

Abbreviations: ISACC: the International Survival Analysis in Colorectal Cancer Consortium; HD: hazards difference; se: standard error

**Table 2.**

Association between genetically determined CRP concentrations and CRC-specific survival

	Additive hazards model		Cox proportional hazards model			
	HD (95% CI) per 100,000 person-year	<i>P</i>	HR (95% CI)	<i>P</i>		<i>P</i>
<b>Using individual-level data</b>						
52-SNP GRS						
Continuous *	-1.15	(-2.76, 0.47)	0.16	0.90	(0.79, 1.02)	0.10
By quartiles						
Q1 (2.05,3.06]	1.00	Ref		1.00	Ref	
Q2 (3.06,3.24]	0.31	(-0.87, 1.49)	0.61	1.02	(0.93, 1.12)	0.67
Q3 (3.24,3.41]	-0.52	(-1.71, 0.68)	0.40	0.96	(0.88, 1.05)	0.41
Q4 (3.41,4.08]	-0.73	(-1.87, 0.41)	0.21	0.93	(0.85, 1.02)	0.14
<b>Using summary statistics</b>						
IVW	-1.12	(-2.72, 0.48)	0.17	0.90	(0.79, 1.02)	0.10
MR-Egger	-1.29	(-3.68, 1.11)	0.29	0.88	(0.72, 1.06)	0.18
Weighted median	-0.77	(-3.02, 1.47)	0.50	0.93	(0.77, 1.11)	0.40

\* Per one-unit increment in GRS;

All models adjusted for age at diagnosis, sex, body mass index, genotyping platform, study and principal components.

Abbreviations: CI: confidence interval; GRS: genetic risk score; HD: hazard difference; HR: hazard ratio; IVW: inverse-variance weighted; MR: Mendelian randomization.

**Table 3.**

Association between genetically determined CRP concentrations and CRC-specific survival, by subgroups

52-SNP GRS	Total	Events*	Cox proportional hazards model		
			HR (95% CI)**	P	
<b>All</b>	16,918	3,808	0.90	(0.79, 1.02)	0.10
<b>By stage at diagnosis<sup>‡</sup></b>					
Local	3,341	142	0.50	(0.24, 1.02)	0.06
Regional	6,420	1,177	0.92	(0.73, 1.17)	0.51
Distant	1,845	1,387	0.97	(0.75, 1.24)	0.79
<b>By tumor location<sup>∥</sup></b>					
Colon	12,000	2,791	0.87	(0.75, 1.00)	0.06
Proximal	6,205	1,365	0.86	(0.69, 1.07)	0.18
Distal	4,879	932	0.98	(0.75, 1.29)	0.91
Rectum	4,729	974	1.02	(0.79, 1.33)	0.85

\* Death events due to CRC within up to 10-year follow-up

\*\* HRs represent per one-unit increase in GRS, and were adjusted for age at diagnosis, sex, body mass index, genotyping platform, study, and principal components; Additive models do not converge in subgroup analysis.

‡ Stage at diagnosis was defined using SEER summary stage (local: AJCC stage I; regional: stage II-III; distant: stage IV)

∥ Proximal colon was defined as from the cecum through transverse colon; distal colon was from the splenic flexure to sigmoid colon; rectum included the rectosigmoid junction and rectum. Abbreviations: CI: confidence interval; GRS: genetic risk score; HR: hazard ratio; AJCC: American joint committee on cancer.